# **Comparative Genomic Analysis and Virulence Differences in** Closely Related Salmonella enterica Serotype Heidelberg Isolates from Humans, Retail Meats, and Animals

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#### **Abstract**

Salmonella enterica subsp. enterica serovar Heidelberg (S. Heidelberg) is one of the top serovars causing human salmonellosis. Recently, an antibiotic-resistant strain of this serovar was implicated in a large 2011 multistate outbreak resulting from consumption of contaminated ground turkey that involved 136 confirmed cases, with one death. In this study, we assessed the evolutionary diversity of 44 S. Heidelberg isolates using whole-genome sequencing (WGS) generated by the 454 GS FLX (Roche) platform. The isolates, including 30 with nearly indistinguishable (one band difference) Xbal pulsed-field gel electrophoresis patterns (JF6X01.0032, JF6X01.0058), were collected from various sources between 1982 and 2011 and included nine isolates associated with the 2011 outbreak. Additionally, we determined the complete sequence for the chromosome and three plasmids from a clinical isolate associated with the 2011 outbreak using the Pacific Biosciences (PacBio) system. Using single-nucleotide polymorphism (SNP) analyses, we were able to distinguish highly clonal isolates, including strains isolated at different times in the same year. The isolates from the recent 2011 outbreak clustered together with a mean SNP variation of only 17 SNPs. The S. Heidelberg isolates carried a variety of phages, such as prophage P22, P4, lambda-like prophage Gifsy-2, and the P2-like phage which carries the sopE1 gene, virulence genes including 62 pathogenicity, and 13 fimbrial markers and resistance plasmids of the incompatibility (Inc)/1, IncA/C, and IncHI2 groups. Twenty-one strains contained an IncX plasmid carrying a type IV secretion system. On the basis of the recent and historical isolates used in this study, our results demonstrated that, in addition to providing detailed genetic information for the isolates, WGS can identify SNP targets that can be utilized for differentiating highly clonal S. Heidelberg

**Key words:** outbreak, antimicrobial resistance, plasmid, SNP analysis, trace-back.

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#### Introduction

Disease caused by nontyphoidal serotypes of Salmonella enterica is the leading cause of food-related death in the United States (Scallan et al. 2011). Salmonella enterica supspecies (supsp.) enterica serovar Heidelberg (S. Heidelberg) has been among the most frequently isolated serovars in clinical cases of salmonellosis, causing an estimated 84,000 illnesses in the United States annually (Foley et al. 2011; Han et al. 2011). It is frequently isolated from poultry and poultry meat (Zhao et al. 2008). S. Heidelberg was the seventh most common serovar isolated from humans in 2011 (CDC 2013) and was found in chicken breast, ground turkey, and eggs, the main sources of S. Heidelberg infections (Chittick et al. 2006; NARMS 2010). S. Heidelberg also tends to be associated with invasive diseases such as septicemia and myocarditis (Wilmshurst and Sutcliffe 1995). After S. enterica supsp. enterica serovar Typhimurium (S. Typhimurium), S. Heidelberg is the serovar of Salmonella most often associated with Salmonella-related deaths in the United States (Kennedy et al. 2004; Patchanee et al. 2008; Crump et al. 2011). The National Antimicrobial Resistance Monitoring System (NARMS), which is responsible for monitoring antimicrobial resistance in Salmonella estimated that 65% of the S. Heidelberg isolates from ground turkey in 2010 were resistant to  $\geq 3$  antimicrobial classes. Presently, the antimicrobial agents to which this serovar is most commonly resistant are ceftriaxone (a drug of choice for treatment), along with resistance to streptomycin, tetracycline, sulfamethoxazole, chloramphenicol, and trimethoprim-sulfamethoxazole (NARMS 2010).

The Centers for Disease Control and Prevention (CDC) investigated a multistate (34 states) outbreak of antimicrobial-resistant *S.* Heidelberg infections comprised of 136 confirmed cases between February 27 and September 13, 2011. Among the 94 case patients for which there was available information, 37 (39%) had been hospitalized and one patient died. Collaborative investigative efforts by state and federal officials implicated ground turkey as the source of this outbreak, and as a result, 36 million pounds of ground turkey meat were recalled (CDC 2011; Folster et al. 2012).

Recently, our investigative capabilities have been greatly enhanced with the development and increasing feasibility of whole-genome sequencing (WGS) as a molecular epidemiological tool to complement current foodborne outbreak investigation techniques. WGS is of particular interest because it provides definitive data for distinguishing outbreak isolates from nonoutbreak isolates in common and highly clonal populations (Allard et al. 2012, 2013). In this study, we sought to determine how effectively WGS and single nucleotide polymorphisms (SNPs) analysis would differentiate outbreak isolates of *S*. Heidelberg from nonoutbreak isolates that share the same *Xbal* and *Blnl* pulsed-field gel electrophoresis (PFGE) patterns. Using WGS data and virulence assays, we also wanted

to determine whether the outbreak isolates belonged to a new strain with potentially higher pathogenicity or whether these isolates were typical members of a common PFGE type present in retail poultry. In addition, the data show the role of transmissible mobile genetic elements in the evolution of virulence and resistance among *S*. Heidelberg.

#### **Materials and Methods**

Bacterial Strains, Growth Condition, and Characterization

Isolates were chosen for the study based on similarity or dissimilarity by PFGE to S. Heidelberg isolated from a large ground turkey-associated outbreak in 2011 (supplementary fig. S1, Supplementary Material online) (CDC 2011; Folster et al. 2012). Forty-four isolates of S. Heidelberg were included in the study (table 1). Isolates were obtained from animal (n=9), retail meat (n=27), and human clinical (n=7) sources in the United States, and one of the isolates was obtained from an unknown sample source in Brazil. Four isolates were collected from 1982 to 1987; 38 of the isolates were collected from 2002 to 2011, and collection dates for two of the isolates were unknown. Five of the isolates were from the Salmonella Reference Collection A (SARA) (Beltran et al. 1991), and nine of the isolates were collected in the course of the investigation of a ground turkey-associated outbreak in 2011 (Folster et al. 2012).

Salmonella isolates were cultured on trypticase soy agar (TSA; Becton, Dickinson, NJ) and in trypticase soy broth (TSA; Becton) overnight at 37 °C. All isolates used for WGS were serotyped by conventional methods and tested for antimicrobial susceptibility according to the NARMS standard protocol as previously described (Zhao et al. 2008). Antimicrobial susceptibility testing, using a panel consisting of 15 antimicrobial agents (amikacin, ampicillin, amoxicillin-clavulanic acid, cefoxitin, ceftiofur, ceftriaxone, chloramphenicol, ciprofloxacin, gentamicin, kanamycin, nalidixic acid, streptomycin, sulfisoxazole, tetracycline, and trimethoprim-sulfamethoxazole) was performed according to the NARMS methodology with the Sensititre automated antimicrobial susceptibility system (Trek Diagnostic Systems, Westlake, OH). Isolate antimicrobial resistance was determined by comparison of MICs to values established MICs by the Clinical and Laboratory Standards Institute (CLSI). PFGE was performed according to the CDC PulseNet protocol (http://www.cdc.gov/pulsenet/pathogens/ index.html, last accessed April 23, 2014). Genomic DNA of each strain was isolated from overnight cultures using DNeasy Blood and Tissue Kit (Qiagen, CA). All S. Heidelberg isolates were stored in TSB containing 15% glycerol at -80°C.

### Genome Sequencing, Assembly, and Annotation

We performed shotgun sequencing of the 44 *S.* Heidelberg using the Genome Sequencer FLX 454 (Roche, Branford, CT) and the GS FLX Titanium Sequencing Kit XLR70 according to the manufacturer's protocol to generate an average genome

Metadata of S. Heidelberg Isolates Used in This Study

enterica serovar and strain	Country	State	Tvne	400					•
			٠. پار.	Date					
Heidelberg str. 20752	NSA	NC	Animal	2002	AMINR000000000		78501	mob1, IncHI2	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 21381	USA	b	Food	2002	AMMZ00000000		80505	mob1, IncA/C	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 24359	USA	МО	Animal	2003	AMNP000000000		78497	mob1, Ind1, IncHI2	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 24388	NSA	МО	Animal	2003	AMNQ000000000		78499	mob1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 24390	NSA	MO	Animal	2003	AMMY00000000		78475	mob1, Ind	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 24391	NSA	MO	Animal	2003	AMNO000000000		78495	mob1, Ind	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 24393	NSA	MO	Animal	2003	AMNM000000000		78491	IncHI2	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 29169	NSA	b	Food	2003	APIX00000000		80527	mob1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 32507	NSA	g G	Food	2003	AMNL00000000		80525	mob1, IncHI2	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41563	NSA	S S	Human	2011	AJGX000000000a	pCFSAN000312_01	78487	mob1, Incl1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41565	USA	WA	Food	2011	AJHA00000000ª		80521	mob1, IncHI2	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41566	NSA	WA	Food	2011	AJGZ000000000ª		78489	mob1, Ind1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41567	NSA	WA	Food	2011	AMNG00000000		80511	mob1, Incl1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41573	NSA	ᆼ	Human	2011	AJGY00000000a	pCFSAN000316_01	80513	mob1, Incl1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41576	NSA	Н	Human	2011	AMINH000000000		80515	mob1, Incl1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41578	NSA	ᆼ	Human	2011	CP004086	pSEEH1578_01,_02,_03	78477	mob1, Ind1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41579	NSA	ᆼ	Food	2011	AJGW000000000 <sup>a</sup>		78479	mob1, Ind1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 41584	NSA	⅀	Human	2011	AMNI000000000		80517	mob1, Incl1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. 82-2052	NSA	ME	Human	1982	AMMX000000000b		78473	Ind1, VirB/D4	P22, Gifsy-2 like, Fels-2, ST64B
Heidelberg str. N1514	NSA	В	Food	2004	AKYM000000000		69871	VirB/D4	P22, Gifsy-2 like
Heidelberg str. N1536	NSA	В	Food	2004	AKYN00000000		69869	Ind, VirB/D4	P22, Gifsy-2 like
Heidelberg str. N15757	NSA	gA GA	Food	2007	AMND00000000		80508	mob1, Ind1, VirB/D4, IncHI2	P22, Gifsy-2 like
Heidelberg str. N18393	USA	b	Food	2008	AMNF00000000		78485	mob1, Ind1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N18413	NSA	₽	Food	2008	AMNS00000000		80529	mob1, Ind1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N18440	NSA	MD	Food	2008	AMNT000000000		80531	mob1, Ind1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N18453	USA	MD	Food	2008	AMINU000000000		80533	mob1, Incl1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N189	NSA	b	Food	2004	AMMP000000000		69873	mob2, Incl1, VB/D4	P22, Gifsy-2 like
Heidelberg str. N19871	NSA	×	Food	2008	AMINC000000000		78481	mob1, Incl1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N19992	NSA	J	Food	5000	AMMC000000000		60299	ColE1	P22, Gifsy-2 like, P2-like
Heidelberg str. N20134	USA	В	Food	5000	AMINN000000000		78493	mob1, Incl1	
Heidelberg str. N26457	NSA	8	Food	2010	AMNE000000000		78483	mob1, Ind1, IncA/C	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N29341	USA	NΜ	Food	2011	AMNJ000000000		80519	mob1, Incl1, VirB/D4	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N30678	NSA	ΣN	Food	2011	AMNK000000000		80523	mob1, Ind1, VirB/D4, IncHI2	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N418	NSA	ΣN	Food	2004	AMMB000000000		20299	mob1, IncA/C	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N4403	NSA	S	Food	2005	AMMT00000000	,	69861	mob2, Ind1, VirB/D4	P22, Gifsy-2 like
Heidelberg str. N4496	NSA	8	Food	2002	AMMQ00000000		29869	VirB/D4	P22, Gifsy-2 like
Heidelberg str. N4541	NSA	b	Food	2005	AMMV000000000		69857	VirB/D4	P22, Gifsy-2 like
Heidelberg str. N4630	USA	В	Food	2002	AMNA000000000		80507	mob1, Incl1	P22, Gifsy-2 like, P4, P2-like
Heidelberg str. N653	USA	OR	Food	2004	AMIMW000000000	pCFSAN000412_01, _02	69855	mob2, Incl1, VirB/D4	P22, Gifsy-2 like
Heidelberg str. SARA31	USA	MD	Animal	1987	AMLV00000000	pCFSAN000441_01	62999	VirB/D4	P22, Gifsy-2 like
Heidelberg str. SARA32	NSA	¥	Animal	1986	AMLU000000000	pCFSAN000442_01	22999	VirB/D4	P22, Gifsy-2 like
Heidelberg str. SARA35	Brazil	n/a	Unknown	n/a	AMLT000000000b	pCFSAN000443_01	92999	ColE1, 8kb resistance plasmid	
Heidelberg str. SARA37	NSA	8	Animal	1987	AMLR00000000		66673	Ind1, VirB/D4	P22, Gifsy-2 like, Fels-2, ST64B
Heidelberg str. SARA 39	V 01 1		:						

<sup>a</sup>First released (Hoffmann et al. 2012). <sup>b</sup>First released (Timme et al. 2013).



coverage of 23×. De novo assemblies were performed using Roche's Newbler software (v.2.6) with the resulting contigs being annotated using the NCBIs Prokaryotic Genomes Automatic Annotation Pipeline (Klimke et al. 2009).

Using DNA from the 2011 clinical outbreak isolate 41578, we also sought to close the genome using the Pacific Biosciences (PacBio) sequencing platform. Specifically, we prepared a single 10-kb library that was sequenced using the  $\rm C_2$  chemistry on eight single-molecule real-time cells with a 90-min collection protocol on the PacBio RS. The 10-kb continuous-long-read data were de novo assembled using the PacBio hierarchical genome assembly process/Quiver software package, followed by Minimus 2, and they were polished with Ouiver.

## Comparative and Phylogenetic Genome Analysis

For comparative analysis, in addition to the 44 isolates sequenced in this study, we included sequence data available for *S.* Heidelberg SL476 complete genome (NC\_011083), two plasmids (NC\_011081 and NC\_011082), and the wholegenome shotgun sequence for *S.* Heidelberg SL486 (ABEL00000000) at the NCBI genome database.

Phylogenetic informative SNP sites (i.e., SNPs shared by two or more strains in the alignment) were identified by two different methods. The first involved mapping the 454 reads to the complete reference genome of S. Heidelberg strain SL476 using Roche Newbler software GS Reference Mapper (v.2.8.). SNP sites were then found using the SNP calling function of GS Reference Mapper. SNP positions were defined, where one or more isolates differed from strain SL476 with coverage  $\geq$ 10× and with  $\geq$ 95% of the reads containing the SNP after having filtered out the SNPs from homopolymer artifacts, followed by a custom pipeline to construct a SNP matrix (Allard et al. 2013). S. Heidelberg SL486 could not be included in this analysis as its raw sequence data were not available. The second SNP detection method was a reference free k-merbased approach implemented in the program kSNP (Gardner and Slezak 2010). This is a collection of Perl scripts that aggregate the results from Jellyfish v1.1.3 (used for k-mer counting) (Marcais and Kingsford 2011) and MUMmer v3.22 (used to align k-mers and detect variable positions) (Kurtz et al. 2004). Analyses with kSNP were based on a k-mer length of 25.

To construct evolutionary relationships among the isolates, the maximum-likelihood (ML) method was implemented in the Genetic Algorithm for Rapid Likelihood Inference (GARLI) software (Zwickl 2006b). GARLI analyses were performed using a web service (Bazinet and Cummings 2011) that uses a special programming library and associated tools (Bazinet et al. 2007). All ML trees were constructed with GTR+I+G nucleotide substitution model. The 100 replicate runs of the nonbootstrapped data set were conducted to identify the most probable phylogeny based on our observed

SNP matrix. We determined branch support by performing 1,000 bootstrap replicates.

We elucidated the relationships among isolates using the Bayesian clustering method implemented in STRUCTURE v2.3.2 (Pritchard et al. 2000; Falush et al. 2003). The analyses were based on the kSNP matrix, and we ran ten replicate analyses at K=2-9 under the admixture model with correlated allele frequencies being performed and visualized with DISTRUCT v1.1. (Rosenberg 2004). Each independent run consisted of 50,000 generations serving as burnin followed by 100,000 generations. The  $\Delta K$  statistic (Evanno et al. 2005) was used to identify the k value that best fits the data. Pairwise genetic distances, calculated as the number of nucleotide differences, were generated in MEGA5 (Tamura et al. 2007). Core genes were identified using the UCLUST algorithm (Edgar 2010) using 95% sequence identity as the cutoff. Alignments of core genes were accomplished using MUSCLE with default settings; these alignments were then used to identify variable core genes.

# Prediction of Prophages, Plasmids, Resistance, and Virulence Genes

Prophages were identified using PHAST (Zhou et al. 2011). Sequences for intact phages were extracted from the original contig, in which they were found and mapped against the entire assembled data to determine whether the phage was present in an isolate at multiple sites on different contigs. Contigs that could not be aligned to the reference genome were evaluated using BLAST to identify plasmids. The plasmids were analyzed by comparative analysis using MAUVE algorithm (Darling et al. 2010) and with the comparative analysis tools of RAST (Aziz et al. 2008). For plasmid closure, a concatenated sequence was generated from a 500-bp sequence from each end of the contig. This artificial sequence from the single contig of the plasmid in study was used as a reference to map all the 454 raw reads, using runMapping from Newbler. If there were mapped reads that covered the conjunction point in the reference, the contig was a closed plasmid.

To determine the incompatibility (Inc) groups for plasmids, we used BLAST to find sequences described by Johnson and Nolan (2009) for specific Inc groups that would produce theoretical PCR amplicons for known Inc group sequences. Resistance and virulence genes were identified by mapping sequence data available at an in-house database, consisting of 1,379 resistance genes, and 107 previously characterized virulence genes (84 pathogenicity and 23 fimbrial markers; Huehn et al. 2009). Using a presence/absence matrix of genes conferring resistance to antibiotics and disinfectant agents, we constructed a similarity tree based on binary distances under neighbor-joining algorithm for tree construction; topological support was assessed based on 100 bootstrap



replicates. The analyses were performed using the R package ape (Paradis et al. 2004; Liu et al. 2011).

#### Caenorhabditis elegans Assay

Pathogenicity was evaluated using the *Caenorhabditis elegans* survival assay. *Caenorhabditis elegans* strain SS104 *glp-4 (bn2)* was acquired from the *Caenorhabditis* Genetics Center. Worm cultures were maintained at 16 °C, which is the permissive temperature for this temperature-sensitive sterile mutant of *C. elegans*. Strains were cultured in *C. elegans* habitation media (CeHM) in tissue culture flasks on a platform shaker (Sprando et al. 2009). Nematodes were bleached (0.5 M NaOH, 1% hypochlorite) to collect eggs, which were incubated in M9 media for 24 h to bring them to synchronized L1 stage and then transferred to CeHM. To produce synchronized L4 stage worms, L1 worms were grown for an additional 72 h in CeHM.

Pathogen lawns for survival assays with test strains, as well as the food bacteria OP50, were prepared by inoculating Nematode Growth Media (in 6-cm Petri plates) with  $50\,\mu l$  of an overnight bacterial culture. Plates were incubated overnight at room temperature before worms were added. We used 60–80 synchronized L4 worms for each treatment group. Worms were scored every 24 h for survival (Aballay et al. 2000).

Animal survival was plotted using Kaplan–Meier survival curves and analyzed by log rank test using GraphPad Prism (GraphPad Software, Inc., La Jolla, CA). Survival assays were repeated at least two times. Survival curves resulting in *P* values < 0.05 relative to control were considered significantly different.

#### **Results**

#### Antimicrobial Resistance and PFGE

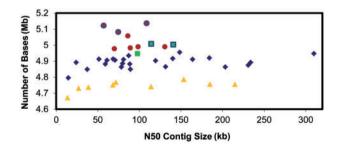
Two representative isolates from the 2011 ground turkey-associated outbreak were previously reported to be resistant to ampicillin, gentamicin, streptomycin, and tetracycline (Folster et al. 2012). Antimicrobial susceptibility testing of seven additional representative isolates showed resistance to ampicillin, gentamicin, and tetracycline among six; and streptomycin, tetracycline, and kanamycin resistance in one of the isolates. The susceptibility and PFGE (Xbal and Blnl) results for all nine of the outbreak representative isolates included in this study and the reference isolates (table 1) are shown in supplementary figure \$1, Supplementary Material online. The nine outbreak associated isolates exhibited indistinguishable, or nearly indistinguishable (one band difference), Xbal PFGE patterns JF6X01.0032 or JF6X01.0058, and *Bln*I pattern JF6A26.0076 and one food isolate had Xbal PFGE pattern JF6X01.0058 and BlnI pattern JF6A26.0017. Of the 35 isolates not associated with the outbreak, 15 had composite Xbal/BlnI PFGE patterns indistinguishable from ground turkey outbreak isolates whereas 20 isolates had composite *Xbal/Bln*I PFGE patterns ≤98% similar to isolates from the 2011 outbreak (supplementary fig. S1, Supplementary Material online). Nine reference isolates showed the same PFGE pattern, as well as the same antibiotic resistance profile, noted for most of the outbreak isolates (supplementary fig. S1, Supplementary Material online).

#### Draft Genome Size

Shotgun sequencing produced 44 draft genomes with an average coverage of  $23\times$  and a minimum of 4,700 genes. The genomic size of the 44 S. Heidelberg isolates (including extrachromosomal DNA) ranged from 4.671 to 5.130 Mb (fig. 1). Differences in genomic size were due primarily to the presence or absence of mobile genetic elements, including phages and plasmids, especially the carriage of IncHI2 or IncA/C plasmids (fig. 1). Next to the genome size variation, figure 1 shows the estimated N50 sizes within S. Heidelberg draft genome sequences. The estimated N50 value is a rough estimate of the quality and coverage of the draft genomes, and it represents the average contig size after assembly with the Newbler software.

# Phylogenetic Relationships among *S. Heidelberg* Using SNP Analysis

Phylogenetically informative SNP sites were identified using two independent methods. Figure 2 shows a ML tree based on SNP analysis of 44 *S*. Heidelberg isolates mapped to strain SL476. Among the collective 40,716 variable SNPs identified, 12,187 were determined to be "informative" (i.e., SNPs shared by at least two isolates). The ML tree shown in figure 2 clearly demonstrates that *S*. Heidelberg formed a monophyletic group distinct from the outgroup comprised *Salmonella enterica* supsp. *enterica* serovar



**Fig. 1.**—The number of assembled bases (Mb) and N50 contig size (kb) for each sequenced *S*. Heidelberg isolate. Samples are colored according to the presence of antimicrobial resistance plasmids. No antimicrobial resistance plasmid, filled triangles; antimicrobial resistance Inc-I plasmid, filled diamonds; antimicrobial resistance Inc-H1/2 plasmid, filled circles; antimicrobial resistance plasmid Inc-I and H1/2, filled circles with borders; antimicrobial resistance plasmid Inc-AC, filled squares; antimicrobial resistance plasmid Inc-AC, filled squares with borders.



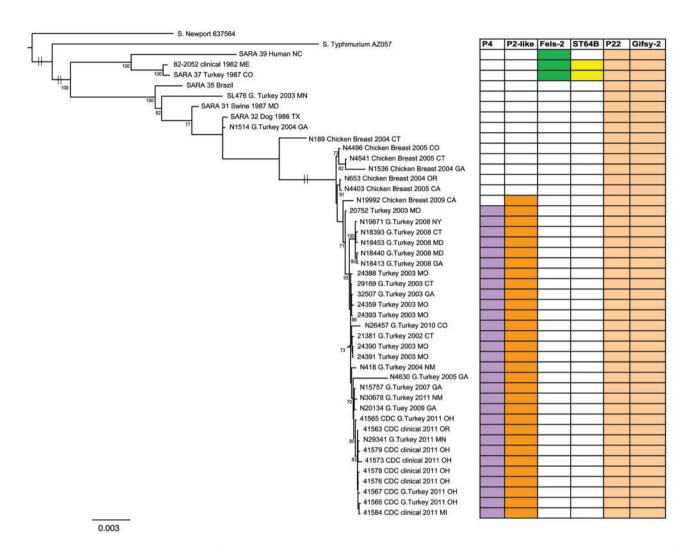


Fig. 2.—ML tree based on SNP analysis of 44 *S*. Heidelberg isolates and previously reported *S*. Heidelberg genome sequences SL476 (12). A total of 40,716 variable SNPs with 12,187 being informative were found using GS Reference Mapper followed by a custom pipeline. The ML tree was generated in GARLI v.2.0 (Zwickl 2006a) under the GTR+Γ model of nucleotide evolution and visualized using Figtree v1.3.1. Parameter space was searched for the best tree with simultaneous estimation for model parameters using a ML search. The best tree was identified from 100 runs on the nonbootstrapped data set. Measures of clade confidence are reported below each node in the form of bootstrap values (1,000 iterations). Bootstrap values <70% were not shown. The tree was rooted using *S*. Newport 637564 and *S*. Typhimurium AZ057. The taxa of source for each isolate, geographic location, and date were mapped onto the tree. Prophage observations are further depicted on the tree using colored bars, shown on the right.

Newport (*S.* Newport) and *S.* Typhimurium. The SNP divergence between *S.* Heidelberg and the two outgroups, *S.* Newport and *S.* Typhimurium, is 24,724 and 24,305 SNPs, respectively. The resultant tree shows two more interesting points. First, isolates having a similar *Xbal* PFGE pattern (supplementary fig. S1, Supplementary Material online) clustered together. Second, there is a tendency for isolates to cluster based on date of collection, such as noted for isolates from 2003, 2008, and 2011. In addition, the 2011 clinical and food isolates that were originally thought to be associated with the ground turkey outbreak isolated in different states clustered together with 80% bootstrap support (fig. 2), which could indicate that they are all members of a clonal community likely derived from the same source. Consistent with the

trend for temporally isolated strains to cluster closely together, one isolate, N29341, that was isolated in Minnesota in 2011 from ground turkey by NARMS, clustered tightly together with the outbreak isolates received from CDC, whereas all other reference isolates having the same PFGE pattern not associated with the ground turkey outbreak are distinct from the isolates of the 2011 outbreak (fig. 2). These results suggest that N29341 might be epidemiologically related to the 2011 outbreaks strains, as Minnesota was one of the states involved in that outbreak.

The SNP matrix, including the same *S.* Newport and *S.* Typhimurium outgroups, built using the k-mer strategy of kSNP consisted of 41,432 variable SNP positions with 10,873 being informative. Using the k-mer strategy, we identified 716

more SNPs than were noted within the in-house pipeline, where 40,716 variable SNPs were observed. Notably, the SNP diversity within the highly clonal *S*. Heidelberg isolates was lower, only 4,053 SNPs were found with 1,394 being informative. The resulting ML tree (fig. 3) was well resolved and congruent with the tree topology in figure 2. To show that the tree topology is not an artifact of mobile elements that are not present in all isolates, we constructed a kSNP matrix using SNPs present only on core genes. This produced a matrix of 24,447 SNPs, of which 7,630 were informative and

present in genes shared by all 46 *S*. Heidelberg isolates and the two outgroups. Only 718 SNPs, with 284 being informative, were found in genes shared only by *S*. Heidelberg isolates. The SNP matrix of the core genes was used to construct a ML phylogenetic tree (supplementary fig. S2, Supplementary Material online), which also confirms the tree topology in figures 2 and 3.

In this study, we determined that all 46 *S.* Heidelberg isolates, including *S.* Heidelberg SL476 and *S.* Heidelberg SL486, partitioned into three paraphyletic groups, each having 100%

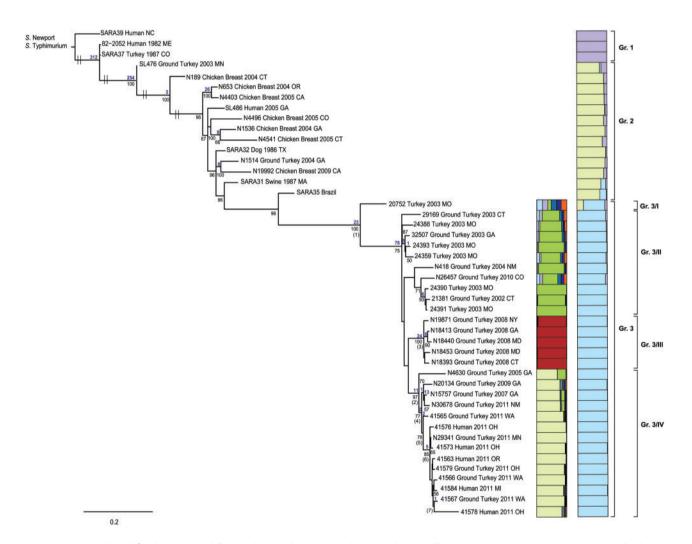


Fig. 3.—ML tree based for the 44 *S*. Heidelberg isolates and two previously reported *S*. Heidelberg genome sequences SL476 and SL486 (Fricke et al. 2011). A total of 4,053 SNPs with 1,394 being informative were found based on k-mer analysis using kSNP. ML trees were generated as described in figure 2. Bootstrap values (1,000 iterations) are reported below each node. The numbers of unambiguous substitutions that mapped to the tree only once and are greater than zero are given above each node in blue. The numbers in parenthesis represent the nodes in table 3. To the right of the tree, two Distruct plots were reconstructed with the same SNP matrix—one including all 46 *S*. Heidelberg isolates and, adjacent to that, another with only those isolates from group 3—to present a fine-scale structure is shown. The Distruct plot was generated using a model-based Bayesian clustering method implemented in Structure v2.3.2 and visualized with DISTRUCT v1.1. 10 replicate analysis at *K* = 2–9 under the admixture model with correlated allele frequencies were performed. Each independent run consisted of 50,000 generations serving as burnin followed by 100,000 generations. Different colors represent the different clusters and each bar represents an individual isolate. The fraction of the bar that is a given color represents the coefficient of membership to that cluster (e.g., multicolored bars indicate membership to multiple groups indicative of admixture).



bootstrap support (fig. 3). Group 1 contains three historical isolates (two clinical and one turkey isolate) with a PFGE pattern, for which there was no assigned Pulse-Net designation (supplementary fig. S1, Supplementary Material online). Group 2 is comprised of 11 isolates, including clinical, food, and animal isolates, with Xbal PFGE pattern JF6X01.0022, as well as the isolates SL476 and N19992 having different Xbal patterns JF6X01.0133 and JF6X01.0326, respectively. Group 3 is composed of 30 isolates from food, animal, and clinical sources, including the outbreak isolates, all having a very similar Xbal pattern (JF6X01.0032, JF6X01.0034, JF6X01.0058).

The distribution of PFGE patterns on the tree topology based on SNPs differs between the two enzymes *Xba*I and *Bln*I. For example, N19992 (group 2) and N18393 (group 3) are quite distinct on the ML tree, even though both have the same *Bln*I pattern JF6A26.0015 and are adjacent to each other on the PFGE dendrogram (supplementary fig. S1, Supplementary Material online). Pairwise SNP variation between the three distinct *S*. Heidelberg lineages seen in figure 3 are presented in table 2 and support the phylogenetic partitions revealed above. Mean divergence among the three clades ranged from 200 to 712 nt differences, whereas the mean intragroup nucleotide differences ranged from 47 to 155 (table 2).

Notably, the mean SNP variation within the outbreak isolates is only 17 SNPs. The phylogenetic analysis clustered the outbreak isolates together even though the PFGE profile (supplementary fig. S1, Supplementary Material online) is slightly different (Xbal pattern JF6X01.0032, JF6X01.0058; Blnl pattern JF6A26.0017 and JF6A26.0076). For example, isolates 41578 and 41579, sharing the same PFGE and antibiotic resistance profile with isolates N19871, N18413, N18440, and N18453 (isolated in 2008), are more closely related to the other outbreak isolates, even though they have a different Xbal pattern. We also found that the outbreak isolates

41578 and 41579 are quite distinct from isolates N19871, N18413, N18440, and N18453, which have 44 SNPs that allow complete discrimination between the two groups (fig. 3). Furthermore, isolate 41565, which has the same PFGE and antibiotic resistance profile as the 2003 isolates 32507, 24393, and 20752, is more closely related to the other isolates associated with the 2011 outbreak, even with having a different *Bln*I pattern and antibiotic resistance profile (fig. 3).

To provide an additional picture as to the number of distinct groups the sampled serovars segregate into, we constructed groups using the program STRUCTURE, the results of which were visualized using DISTRUCT (fig. 3). The results are consistent with the groupings formed through the phylogenetic analyses in that there are three distinct groups (each represented by a different color [fig. 3]).

# Differences between Outbreak Isolates and Nonoutbreak Isolates in Group 3

To further investigate the relationships among outbreak isolates, we constructed the Distruct plot for group 3. Within that group, there is support for four subgroups; these four groups also are found in the phylogenetic analysis, each with a >75%bootstrap support. Pairwise SNP variation between the four sublineages also support the phylogenetic partitions described above (table 2 and fig. 3). Mean divergence among the four subclades ranged from 36 to 153 nt differences, whereas the mean intragroup nucleotide differences ranged from 15 to 30 (table 2). The 2008 strains seem to have guite a unique SNP profile when compared with the remaining isolates of group 3. The ML tree, the Distruct plot, and the pairwise SNP variation show the evolutionary changes occurring among isolates from 2003 to 2009 and 2011, revealing the apparent emergence of the genetically unique S. Heidelberg strain that was responsible for the 2011 outbreak.

**Table 2**(Mean Pairwise Distance (Number of Nucleotide Differences) between the (A) Three Major S. Heidelberg Groups in figure 3 and the (B) Four S. Heidelberg Subgroups from Group 3 in figure 3

	S. Heidelberg Gr. 1	S. Heidelberg Gr. 2	S. Heidelberg Gr. 3	
(A)				
S. Heidelberg Gr. 1	155ª			
S. Heidelberg Gr. 2	535	101 <sup>a</sup>		
S. Heidelberg Gr. 3	712	200	47 <sup>a</sup>	
	Gr. 3/I	Gr. 3/II	Gr. 3/III	Gr. 3/IV
(B)				
S. Heidelberg Gr. 3/I	n/c			
S. Heidelberg Gr. 3/II	144	30 <sup>a</sup>		
S. Heidelberg Gr. 3/III	139	42	15 <sup>a</sup>	
S. Heidelberg Gr. 3/IV	153	46	51	27 <sup>a</sup>
Outbreak isolates	151	46	65	36

<sup>&</sup>lt;sup>a</sup>Intragroup mean pairwise distance (number of nucleotide differences).

Table 3 lists variable genes having unique nucleotide substitutions which defined specific sublineages that could be used to separate them from other highly clonal S. Heidelberg isolates in group 3. Table 3 also lists their SNP change and, if applicable, the gene carrying the SNPs and the resulting amino acid change. Twenty-three unique SNPs, with 14 being nonsynonymous (i.e., causing an amino acid change) SNPs, were found to be unique to group 3 and clustering together isolates with Xbal pattern (JF6X01.0032, JF6X01.0034, JF6X01.0058). These nucleotide substitutions were found on 20 different genes that could be useful for subtyping of strains belonging to group 3 (table 3 and fig. 3). Furthermore, 24 unique SNPs (11 being nonsynonymous) were found at the node that characterizes the 2008 ground turkey isolates, which seemed to have their own unique SNP profile distinct from that of the remaining group 3 isolates. Twelve of the 24 SNPs are located on the insertion sequence (IS) 2 element with five SNPs being within the IS2 TnpA transposase and seven SNPs on the IS2 TnpB transposase genes (table 3 and fig. 3).

Importantly, two nonsynonymous SNPs were found to be only present in all isolates associated with the 2011 outbreak. These two SNPs were located within two different variable core genes: a putative hydrolase with amino acid change P653Q, and the gluconate transporter GntP gene with amino acid change L187V (table 3 and fig. 3). Five SNPs, with four being nonsynonymous, were unique to isolates 41563, 41566, 41567, 41573, 42578, 41579, and N29341 (associated to the outbreak) and not observed in 41565 (table 3 and fig. 3). From these five SNPs, three were in plasmid sequences, whereas two were found on variable core genes: the flagellin CDS resulting in an amino acid change from threonine to serine at position 282 (ΔT282S), and within a putative hypothetical protein (possibly functioning as H+ gluconate symporter related to permeases) producing an amino acid change from glycine to serine at position 358 (ΔG358S) (table 3).

#### Genetic Variation among S. Heidelberg

At a minimum, 273 genes involved in a variety of different functions, such as DNA replication and repair, cell division, transcription, metabolism, and virulence, vary among the *S.* Heidelberg isolates observed in clinical, animals, and/or food samples, including the isolates associated with the 2011 outbreak. The variable core genes, including the number of SNPs and haplotypes are listed in supplementary table S1, Supplementary Material online. Figure 4 shows a histogram comparing strains based on: 1) the number of SNPs according to the number of core genes and 2) the haplotype diversity according to the number of core genes. Only a few mutation "hotspot" genes, such as tailspike (35 SNPs), scaffolding protein (22 SNPs), DNA polymerase V subunit *umuD* (20 SNPs), phage lysozyme (18 SNPs), gifsy-2 prophage

protein (15 SNPs), terminase small subunit (14 SNPs), outer membrane lipoprotein Blc (7 SNPs), and alpha amylase (6 SNPs), were found to have a disproportionate number of SNPs that could be useful for rapid subtyping the serovar Heidelberg and/or as targets of resequencing. Interestingly, although these genes have several SNPs, the haplotype diversity is fairly low, with only a few haplotypes (2–4) among 46 isolates being identified. This fact suggests that, even though there are genes with up to 35 SNPs, there are only two to four unique sequences among *S*. Heidelberg that are congruent with our tree topology for three different groups of *S*. Heidelberg.

### Complete Genome from Clinical Isolate 41578

In the course of performing this study, we demonstrated that it was possible to rapidly determine the complete sequence for the chromosome and three plasmids from a clinical isolate associated with the 2011 outbreak using the Pacific Biosciences (PacBio) system. A single contig of 4,793,479 bp (GC content 52.2%) representing the complete chromosome and three contigs of 4,773 bp, 35,297 bp, and 117,929 bp representing three plasmids were generated. The chromosome contains 12 different Salmonella pathogenicity islands and four prophages (prophage P22, lambda-like prophage Gifsy-2, prophage P4, and prophage P2-like; fig. 5). The largest plasmid pSEEH1578\_01 is a resistance plasmid with incompatibility group Incl1 encoding the resistance to gentamicin (aacC), streptomycin (aadA1), tetracycline (tetA, tetR(A)), and ampicillin (blatem1) (fig. 5). The plasmid pSEEH1578\_02 is a VirB/D4 plasmid that carries the type IV secretion system (T4SS; fig. 5), and plasmid pSEEH1578\_03 is a mobilization plasmid that carries genes capable of promoting plasmid mobilization such as mbeA, mbeB, mbeC, and mbeD.

## Identification of Prophages

PHAST analysis identified six different phages among the *S*. Heidelberg isolates. Only those phages that PHAST determined as being intact were further analyzed. All 44 isolates contained prophage P22 and lambda-like prophage Gifsy-2. Group 1, which was composed of three historical isolates (SARA 39, SARA 37, and 82-2052), also contained prophage Fels-2, not observed in any of the group 2 or group 3 isolates. Additionally, SARA 37 and 82-2053 also contained prophage ST64B (table 1 and fig. 2).

Heidelberg isolates belonging to group 3, which includes the 2011 outbreak isolates, contained prophage P4 and P2-like, neither of which was seen in any of the isolates from group 1 and 2, excepting isolate N19992, a group 2 isolate that was confirmed to contain the P2-like prophage (table 1 and fig. 2). The phage presence and absence matrix shows correlation with the tree phylogeny shown in figure 2.



**Table 3**Antibiotic Resistance and Plasmid Characteristics of *S.* Heidelberg Isolates Used in This Study

Node on Tree	SNP Location	NT Change	AA Change	NT Position	Locus Tag
1	D-Mannonate oxidoreductase	$A \rightarrow G$	$D \rightarrow G$	839	SEEHRA37_03221
	Translocation protein TolB	$T \rightarrow A$	Р	1152	SEEHRA37_24108
	Glutathione S-transferase	$C \rightarrow A$	$W \rightarrow Stopp$	233	SEEHRA37_20055
	Nonannotated	$C \rightarrow T$	$R \rightarrow C$	n/a	SEEHRA37_contig25
	Hypothetical protein/putative transcriptional regulator	$G{ ightarrow} T$	$V \rightarrow F$	376	SEEHRA37_19825
	Ureidoglycolate dehydrogenase AllD	$C \rightarrow T$	$T \rightarrow I$	20	SEEHRA37_20355
	Starvation-inducible outer membrane lipoprotein	$C \rightarrow T$	S	63	SEEHRA37_07830
	ATPase recombination and repair protein	$G{ ightarrow} T$	L	966	SEEHRA37_05779
	DNA-specific endonuclease I	$A \rightarrow C$	$K{ ightarrow}T$	341	SEEHRA37_19810
	Scaffolding protein	$C \rightarrow A$	V	135	SEEHRA37_21903
	Peptidase T	$G{ ightarrow} T$	$V \rightarrow L$	976	SEEHRA37_13506
	Predicted metal-dependent membrane protease	$C \rightarrow A$	Α	108	SEEHRA37_15707
	Hypothetical protein	$A \rightarrow G$	$N \rightarrow D$	418	SEEHRA37_04201
	Glycine/serine hydroxymethyltransferase GlyA	T→G	$S \rightarrow A$	145	SEEHRA37_00365
	Preprotein translocase subunit SecF	$G{ ightarrow} A$	Α	534	SEEHRA37_22413
	Hypothetical protein	$A{ ightarrow} G$	$T \rightarrow A$	1879	SEEHRA37_01714
	Ribosomal protein L21 RplU	$A \rightarrow C$	$I \rightarrow L$	220	SEEHRA37_20845
	Nonannotated	C→G	Q→E	n/a	SEEHRA37_contig19
	Isoaspartyl peptidase	C→T	A→V	380	SEEHRA37_16329
	Lysine-N-methylase	C→T	G	57	SEEHRA37_07110
	Hypothetical protein	T→C	L	162	SEEHRA37_23678
	Hypothetical protein	A→C	– K→T	227	SEEHRA37_07475
	Nonannotated	T→C	l→V	n/a	SEEHRA37_contig14
	Honarinotatea	. / C	. , •	11/4	JEETHO 137_contagr
	Hypothetical protein	$A{ ightarrow} G$	$Q \rightarrow R$	851	SEEHRA37_20355
	Sensor kinase DpiB	$A \rightarrow T$	$I \rightarrow F$	67	SEEHRA37_10675
	Notannotated	$C \rightarrow T$	Р	63	SEEHRA37_contig6
	Hypothetical protein	$G{ ightarrow} A$	F	n/a	SEEHRA37_contig6
	Nonannotated	$G{ ightarrow} A$	$G{ o}S$	n/a	SEEHRA37_contig5
	Proline dehydrogenase PutA	$C \rightarrow A$	G	975	SEEHRA37_04036
	Electron transport complex protein RnfC	T→C	1	276	SEEHRA37_02971
	Protein involved in chromosome partitioning MukB	$G{ o}C$	$G{ o}A$	1514	SEEHRA37_14706
	N-ethylmaleimide reductase	$A \rightarrow T$	G	351	SEEHRA37_02866
	Hypothetical protein	C→T	Ĺ	1039	SEEHRA37_16509
	Multidrug efflux system subunit MdtC	A→T	$Q \rightarrow H$	2067	SEEHRA37_00060
	Putrescine/spermidine ABC transporter ATPase	$G{ ightarrow} T$	$P \rightarrow Q$	47	SEEHRA37_13511
	protein PotA				
	Pilus assembly protein, porin PapC	$G{ ightarrow} T$	$R{ ightarrow}S$	4	SEEHRA37_18324
	IS2 repressor TnpA	$G{ ightarrow} A$	Т	93	SEEH8393_18082
	IS2 transposase TnpB	$A{ ightarrow} G$	Т	195	SEEH8393_18077
	IS2 transposase TnpB	$A{ ightarrow} G$	$N \rightarrow D$	502	SEEH8393_18077
	IS2 transposase TnpB	$G{ ightarrow} A$	Α	483	SEEH8393_18077
	Not annotated (plasmid sequence)	T→C	$A{ ightarrow}V$	n/a	SEEH8393_contig56
	IS2 repressor TnpA	C→T	Υ	309	SEEH8393_18082
	IS2 repressor TnpA	A→G	E	195	SEEH8393_18082
	IS2 transposase TnpB	C→A	V	525	SEEH8393_18077
	IS2 transposase TripB	C→A	P	192	SEEH8393_18077
	IS2 transposase TripB	C→A A→G	A	789	SEEH8393_18077
	YacA	A→G T→G	V	123	
	Hypothetical protein		v A→T	232	SEEH8393_01004 SEEHRA37_09669
	Multifunctional fatty acid oxidation complex	G→A G→T	A→I M→I	2094	SEEHRA37_09669 SEEHRA37_15762
	iviantifulictional fatty actu oxidation complex	u→ 1	IVII	2034	SEEHRA37_15762

(continued)



Table 3 Continued

Node on Tree	SNP Location	NT Change	AA Change	NT Position	Locus Tag
3	tRNA uridine 5-carboxymethylaminomethyl modification enzyme GidA	$G{ ightarrow} A$	G→S	1199	SEEHRA37_11040
3	Permease DsdX	$C \rightarrow A$	$A \rightarrow D$	1166	SEEHRA37_02334
3	IS2 transposase TnpB	$T \rightarrow C$	R	549	SEEH8393_18077
3	IS2 repressor TnpA	$C \rightarrow T$	Α	225	SEEH8393_18082
3	IS2 transposase TnpB	$C \rightarrow A$	$P{ ightarrow}T$	319	SEEH8393_18077
3	IS2 repressor TnpA	$C \rightarrow T$	L	102	SEEH8393_18082
3	Arginyl-tRNA synthetase ArgS	$A \rightarrow T$	G	237	SEEHRA37_07325
3	Nonannotated	$C \rightarrow A$	$A \rightarrow N$	n/a	SEEHRA37_contig18
3	Hypothetical protein	$G{ ightarrow} A$	$D {\rightarrow} N$	103	SEEHRA_37_05617
4	Not annotated	$G{ ightarrow} A$	$V{ ightarrow}L$	n/a	SEERA37_contig2
4	Sodium/glucose cotransporter	$G{ ightarrow} A$	$S \rightarrow N$	1037	SEERA37_14011
5	Phosphoserine phosphatase	$C \rightarrow A$	$P \rightarrow Q$	653	SEEHRA37_11265
5	Gluconate transporter GntP	$C \rightarrow G$	$L {\rightarrow} V$	187	SEEHRA37_18800
6	Flagellin and related hook-associated proteins	$G{ ightarrow} C$	$T \rightarrow S$	282	SEEHRA37_18390
6	Electron transfer flavoprotein, beta subunit	$G{ ightarrow} A$	$G \rightarrow S$	358	SEEHRA37_02456
6	Hypothetical protein (plasmid sequence)	$C \rightarrow A$	$L \rightarrow M$	562	SEEH8393_17461
6	Not annotated (plasmid sequence)	$G{ ightarrow} A$	$G \rightarrow R$	n/a	SEEH8393_contig56
6	Not annotated (plasmid sequence)	$C{ ightarrow}T$	$G{ ightarrow} S$	n/a	SEEHRA39_contig149
7	Type III secretion protein SopE	$T{ ightarrow}A$	$H{ ightarrow}Q$	560	SEEHRA37_14371

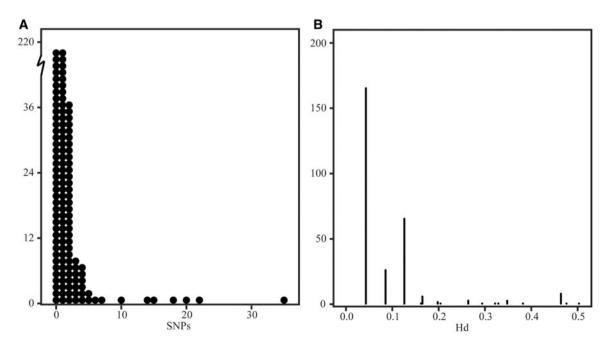


Fig. 4.—(A) Histogram showing the number of SNPs per core genes. (B) Histogram showing haplotype diversity for all variable, core genes.

## Identification of Virulence Genes among S. Heidelberg

From the 107 known and recognized Salmonella-associated virulence genes, we identified 62 pathogenicity and 13 fimbrial markers that were highly conserved among the 44

S. Heidelberg isolates (supplementary table S2, Supplementary Material online). One outer membrane fimbrial usher gene, safC, was only found in the three historical isolates (SARA 39, SARA 37, and 82-2052), all belonging to group 1. All other

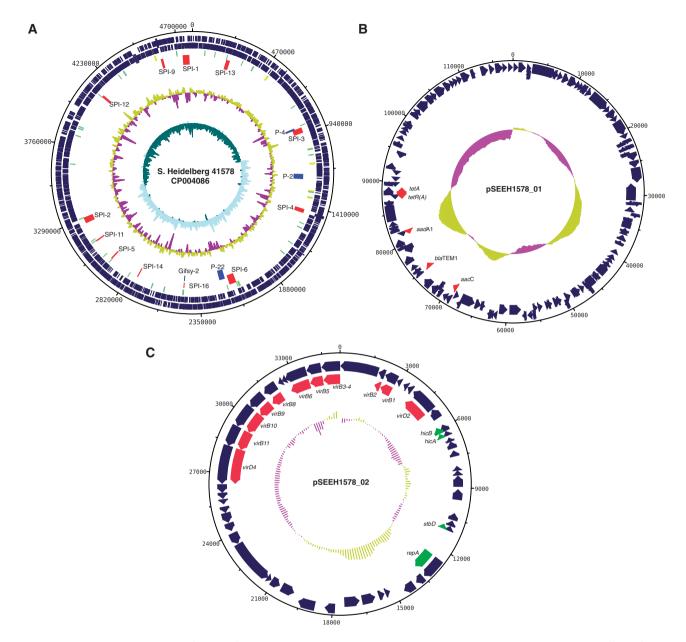


Fig. 5.—Chromosome and plasmids features of a clinical S. Heidelberg isolate 41578. The circular map was drawn using dnaplotter. Different features are shown in different colored bars. (A) Chromosome: The coding sequence are shown in dark blue, rRNA is shown in green, tRNA is shown in yellow, prophages are shown in blue, and S-almonella pathogenicity islands are shown in red. Track T represents the GC content while Track T shows the GC skew [(T - C)/T + C]. (T - Regions of GC content above average are shown in dark blue and resistance genes are shown in red. Track T shows the GC skew [(T - C)/T + C]. Regions of GC content above average of the plasmid are drawn outside the ring in yellow, whereas regions below average are inside the ring in purple. (T - C) VirB/D4 virulence plasmid: The coding sequences are shown in dark blue, genes that carry the T4SS are shown in red, genes responsible for plasmid stability, and replication is shown in green. Track T - Shows the GC skew [(T - C)/T + C]. Regions of GC content above average of the plasmid are drawn outside the ring in yellow, whereas regions below average are inside the ring in purple.

detected virulence genes, observed to be located on the *Salmonella* pathogenicity islands (SPI-1, SPI-2, SPI-3, SPI-4, and SPI-5), the lambda-like prophage Gifsy-2, and/or islets, were present in all *S*. Heidelberg isolates, suggesting that all isolates are pathogenic (supplementary table S2, Supplementary Material online). For example, all isolates carried a

chromosomal *msg*A gene, which is essential to *Salmonella* mouse virulence (Gunn et al. 1995), and is common in *S*. Typhimurium (Huehn et al. 2010). Other genes present among all isolates encoded proteins involved in type III secretion system (T3SS) and adhesins. Remarkably, the *sopE1* virulence gene, involved in the translocation of effector proteins

into host cells, was found in all of our strains. Moreover, although sopE1 is known to be carried by P2-like phages, in this study we also identified this gene on lambda-like phage Gifsy-2, which is present in all S. Heidelberg isolates. Consequently, all S. Heidelberg isolates have the sopE1 virulence gene. Group 3 isolates, which also contain the P2-like phage, have the sopE1 gene twice in their chromosome; one gene is carried by lambda-like phage Gifsy-2 and the other one is located on the P2-like phage. Analysis confirmed that these two genes shared a high degree of similarity having no more than eight mutations between the two different sopE1 alleles. In contrast, virulence determinants known to be associated with SPI-7, prophage Gifsv-1, Gifsv-3, Fels-1, and Salmonella plasmid virulence (spv) were not identified in any of the 44 isolates examined in this study, confirming sequencing results that none of the strains carried any of these mobile genetic elements.

### Description of VirB/D4 Plasmids

Several plasmids were found among the 44 S. Heidelberg isolates sequenced in this study (table 1). Electrophoresis of samples obtained using a basic alkaline plasmid purification procedure demonstrated the presence of endogenous plasmids that had not integrated into the host genome (data not shown). The plasmid sizes varied from 3.7 to over 200 kb. Twenty-one S. Heidelberg isolates, including all five human isolates and two ground turkey isolates associated with the 2011 outbreak, contained a plasmid ranging in size from 33 to 40 kb, which carried genes (virB1, virB2, virB3-4, virB5, virB6, virB7, virB8, virB9, virB10, virB11, virD2, and virD4) associated with the VirB/D4 T4SS (table 1). Three specific roles for the bacterial T4SS have been identified: 1) to facilitate translocation of DNA via a conjugative mechanism to recipient cells; 2) to facilitate translocation of effector molecules, such as proteins, to eukaryotic target cells; and 3) to function in DNA uptake or dissemination from or into the environment milieu (Christie et al. 2005; Alvarez-Martinez and Christie 2009).

To further study the diversity among all 22 identified VB/D4 plasmids, we identified SNPs that might be useful in differentiating these plasmids. The SNP matrix from the 22 plasmids and the reference plasmid built using the k-mer strategy of kSNP consisted of 338 informative SNP positions. Figure 6 shows a ML tree based on SNP analysis. The phylogeny placed the VB/D4 plasmids into three well-supported clades (95%, 100%, and 100% bootstrap support). Clade I contained two plasmids isolated from the historical isolates, SARA 37 and 82-2052, belonging to group 1 on the ML tree shown in figure 3. Clade III is composed of ten plasmids, including the reference plasmid pSARA30 and 9 isolates belonging to group 2 in figure 4. Clade II contains 11 plasmids, including 7 plasmids from 7 isolates associated with the 2011 outbreak. Clade II can be further separated into two subclades, one of which contains nine plasmids derived from isolates belonging to group 3 in figure 4, while subclade 2 contains one clinical isolate and isolate N653, the unique isolate found to carry two VB/D4 plasmids (the other plasmid partitioned into clade III). Moreover, using the primers designed by Johnson et al. (2012) for the relaxase gene (taxC) (VirD2 component) to screen for the four different lncX subgroups, we determined that the VB/D4 plasmids from clade I, subclade 1 from clade II, and clade III belonged to the lncX1 plasmid subgroup, whereas the two plasmids from clade II subclade 2 were deemed to be members of the lncX4 subgroup.

Interestingly, isolate N653 carried two plasmids, one being in the IncX1 and another in the IncX4 incompatibility groups. It appears that there are significant differences among these groups that allow simultaneous maintenance of two plasmids belonging to the same incompatibility group, a heretofore believed unachievable occurrence. Given the notion that two plasmids in the same Inc group cannot simultaneously coexist within the same bacterium, another plausible explanation could be that IncX4 might actually belong to a different incompatibility group other than that of IncX1, which was only previously experimentally confirmed to belong to IncX (Norman et al. 2008). Consistent with this hypothesis was the fact that a BLAST search with the IncX4 repA gene (present only in both putative IncX4 plasmids) sequence identified significant sequence similarity to only the Citrobacter rodentium ICC168 plasmid pCROD2 (previously grouped to IncX4 [Johnson et al. 2012]) and two plasmids from S. Heidelberg (pSH163\_34, pSH696\_34), suggesting that the IncX4 group is a new incompatibility group distinct from that of IncX1. If this is confirmed to the case, coexistence of these two "IncX" plasmids would be explained, although additional research needs to be conducted to confirm this possibility.

In this study, eight of the plasmids carrying the VirB/D4 T4SS were completely sequenced including the two plasmids from isolate, N653 (table 1). The annotated sequence demonstrated that the eight plasmids carry, in addition to the VirB/D4 T4SS systems, genes encoding other virulence-associated determinants and several proteins involved in a variety of metabolic processes, for example, hemolysin expression-modulating gene *ymoA*, DNA-binding protein genes (*hns*), (*stpA*), the toxin/antitoxin stability genes (*stbE*), (*stbD*), IncN plasmid Kika gene (*kika*), and DNA topoisomerase III (*topB*).

A progressive Mauve alignment using the data from the eight completely sequenced plasmids and the reference *S*. Heidelberg plasmid pSARA30 (supplementary fig. S3, Supplementary Material online) separated the plasmids into three distinct groups. As expected, the plasmids partitioned in different clades in the plasmid VirB/D4 ML tree (fig. 6) were also found by Mauve analysis to belong to different groups. Group 1 included plasmids isolated from *S*. Heidelberg SARA 31, SARA 32, N4403, and N653, all having a size of approximately ~38.0 kb and showing the highest degree of sequence similarity to the *S*. Heidelberg plasmid pSARA30. Unique to



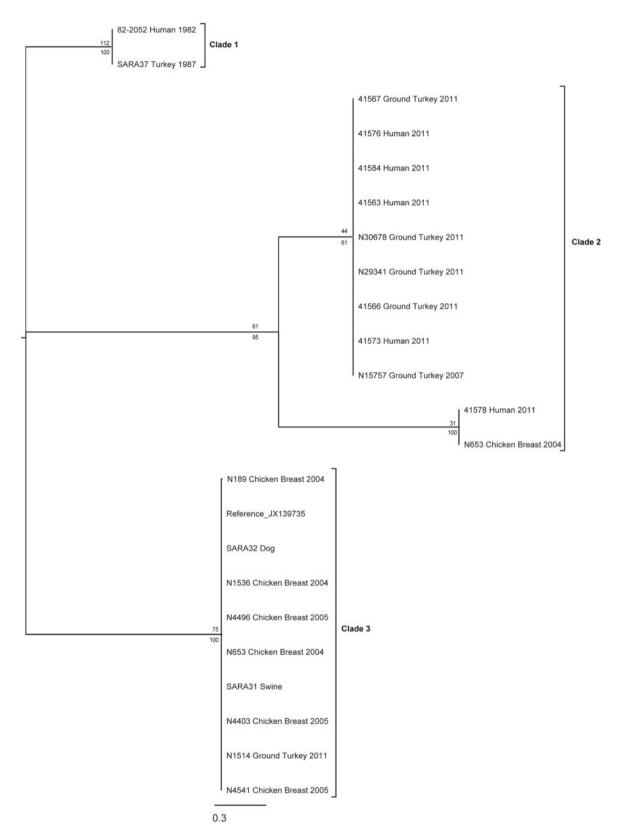


Fig. 6.—ML tree based for the 22 identified VB/D4 plasmids, including the reference *S*. Heidelberg plasmid pSARA30. A total of 338 SNPs with all being informative, were found based on k-mer analysis using kSNP. The numbers of unambiguous substitutions that mapped to the tree only once are given above each node. ML trees were generated as described in figure 3. Bootstrap values (1,000 iterations) are reported below each node.

this group are several hypothetical proteins: truncated transposase, DEAD/DEAH box helicase domain protein, and putative N-acetyltransferase. The second group is composed of the plasmids isolated from S. Heidelberg 41573 (~38 kb) and 41563 (~33 kb)—both involved in the 2011 outbreak. The best BLAST hit for them is Escherichia coli plasmid pDKX1-TEM-52 (GenBank accession number: JQ269336). Attributes unique to this group are several hypothetical proteins, a replicon initiation protein, and an ATPase central domaincontaining protein. The third group contains plasmids isolated from S. Heidelberg 41578, a 2011 outbreak clinical isolate, and the chicken breast isolate N653. Both plasmids are ~35 kb in size and members of the IncX4 subgroup. They share a high degree of sequence similarity to C. rodentium ICC 168 plasmid pCROD2 (FN543504). Unique to this group are some metabolic genes, such as putative toxin-antitoxin system genes (hicA), (hicB), DnaJ-class molecular chaperone (dnaJ) (heat shock protein), plasmid replication gene (repA), site-specific recombinase (xerD), and acetyl-CoA carboxylase beta subunit (accD). With regards to the VirB/D4 gene clusters found on the IncX or IncX-like plasmids in this study, a considerable variation was observed, sometimes having <55% sequence identity between homologous genes (supplementary figs. S3 and S4, Supplementary Material online), a phenomenon that has been observed elsewhere among the Enterobacteriaceae (Johnson et al. 2012). Comparison of the plasmids from the three groups demonstrated that most of the T4SS-associated genes divergence was seen in plasmids derived from group 3 isolates.

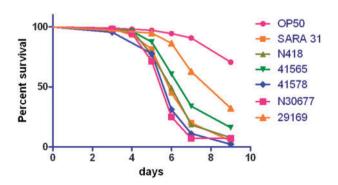
Noteworthy was the observation that three of these eight plasmids, each isolated from different 2011 clinical outbreak strains (41563 OR Blood, 41578 OH stool, 41573 OH Urine), differed in DNA sequence and gene carriage, suggestive of extensive horizontal gene transfer (HGT) or a mixed subpopulation of *S*. Heidelberg isolates.

#### Caenorhabditis elegans System

To answer the question whether the isolates that contain the VirB/D4 plasmid are more virulent, we performed a survival assay using a C. elegans system to compare the virulence potential of our strains. This system has been used successfully as an invertebrate host model to assess the virulence determinants of human pathogens, such as Vibrio cholerae (Sahu et al. 2012) and S. Typhimurium (Aballay et al. 2000). We tested six different S. Heidelberg isolates (four ground turkey isolates, one swine isolate, and one clinical outbreak isolate) having different plasmid profiles. Strain 29169 singly carries a small mobilization plasmid; strain SARA 31 carries only the VirB/D4 T4SS plasmid; strain 418 carries a small mobilization plasmid and an IncA/C plasmid; strain 41565 carries a small mobilization plasmid and an IncHI2 plasmid; strain 41578 has a small mobilization plasmid, the VirB/D4 T4SS plasmid, and an Incl1 plasmid; and N30678 has four plasmids: the small mobilization plasmid, the VirB/D4 T4SS plasmid, the Incl1, and the IncHI1. Except SARA 31, in which phage P4 and P2-like were not present, all other isolates had the same phage profile.

The results, which showed that S. Heidelberg isolates are significantly (P < 0.0001) more pathogenic than the E. coli OP 50 control strain, failed to demonstrate any appreciable difference in pathogenicity between strains carrying the VirB/D4 T4SS plasmid and those strains that did not (fig. 7). However, we also identified some VirB/D4 T4SS components on the resistance plasmids IncA/C, IncHI2, and IncI1. Interestingly, isolate 29169, which did not carry any large plasmid and any of the T4SS components, was found to be significantly (P < 0.0001) less pathogenic using this assay than any of the other isolates evaluated. Isolate 41565, which carried the small mobility plasmid as well as additional IncHI2 plasmid, demonstrated the second weakest pathogenic potential. Isolate SARA 31, which carried the VB/D4 T4SS plasmid but no other resistance plasmid, showed a survival curve profile similar to that of isolate N418, which did not have the VB/D4 T4SS plasmid but carried the IncA/C plasmid.

The highest degree of pathogenicity was seen in N30678, which carries four plasmids including resistance and VB/D4 plasmids, and it is significantly (P < 0.05) different from all other isolates except the clinical outbreak isolate 41578, which also consist resistance and VB/D4 plasmids (fig. 7). The data show that isolates not carrying any T4SS components tend to be significant less (P < 0.0001) pathogenic than those isolates that do carry the VB/D4 T4SS plasmid. Moreover, those strains that carry both the VB/D4 T4SS plasmid and an antibiotic resistance plasmid, which also carries the T4SS genes, demonstrated a pathogenic potential greater than isolates carrying only one of these plasmids.



**Fig. 7.**—Caenorhabditis elegans survival data from six *S.* Heidelberg isolates. The figure shows that the six *S.* Heidelberg isolates (29169, SARA 31, 418, 41565, 41578, and N30678) are significantly (P < 0.0001) more pathogenic than the *Escherichia coli* OP 50 control strain. Further the figures show that isolates not carrying any T4SS components tend to be significant less pathogenic than those isolates that do carry them.



# Identification of Antimicrobial Resistance Genes and Plasmids

Analysis of WGS data showed 27 plasmid-associated antibiotic resistance genes among the 44 isolates and included genes expected to produce resistance to aminoglycosides, beta-lactams, phenicols, folate pathway inhibitors, tetracyclines, and cephems. These genes were not detected in the eight pan susceptible isolates that also did not carry any of the antibiotic resistance plasmids. Resistance phenotypes correlated with genotypes in all strains examined (table 4). However, some strains with the same genotype exhibited different antimicrobial resistance patterns. For example, both strains N18440 and N18413 contain the aadA1 gene but only isolate N18440 showed resistance to streptomycin. In this study, streptomycin resistance was defined using the MIC value >32 mg/l determined by CLSI. However, studies have shown that strains harboring an aadA gene cassette can have MICs of 16 mg/l, which would classify these strains as streptomycin-susceptible (Sunde and Norström 2005).

Among the 36 S. Heidelberg isolates resistant to one or more antibiotics, 24 contained sequences indicative of presence of an Incl1 plasmid, 5 had an IncHI2 plasmid, and 1 carried an IncA/C plasmid. Three isolates contained two plasmids, one with Incl1 + IncHI2, and two isolates each having Incl1 + IncA/C replicons (table 4). Besides isolate 41565, which carries an IncHI2 plasmid, all Heidelberg isolates associated with 2011 outbreak carry an Incl1 plasmid, which was detected the most overall among our strains. The Incl1 plasmid carries several antibiotic resistance genes and components of the T4SS. The IncHI2 plasmid was found in eight isolates and carries several antibiotic resistance genes and genes conferring resistance to quaternary ammonium compounds, as well as genes encoding the conjugative T4SS. Furthermore, unique to the IncHI2 plasmid is the presence of genes encoding resistance to heavy metals, including tellurium, copper, cadmium, mercury, and silver.

The three isolates resistant to the most (ten or more) antibiotics carried the IncA/C multidrug resistance plasmid. In addition to carrying the genes encoding resistance to different antibiotics and quaternary ammonium compounds, this plasmid also carries the conjugative T4SS transfer system. All three IncA/C plasmids carried the resistance element *bla*<sub>CMY-2</sub>-*blcsugE2*, which was only found in one other isolate, N189, on an IncI1 plasmid.

SARA 35, which was only resistant to ampicillin, did not carry a multidrug resistance plasmid but, instead, carried a smaller plasmid ( $\sim$ 8.0 kb) having only a single determinant that correlated with resistance to  $\beta$ -lactams (tnpA- $bla_{TEM-1}$ ). This plasmid shared a high degree of sequence similarity to S. Typhimurium pAnkS (accession number: DQ916413), which also carried the transposon resistance element (tnpA- $bla_{TEM-1}$ ). The Inc group for this plasmid could not be determined from the sequence.

Figure 8 shows a neighbor-joining tree generated from a presence/absence matrix of resistance genes for the 30 group 3 Heidelberg isolates having a common PFGE profile. As expected, resistance tended to segregate according to the particular Inc group plasmid they carried and not by clonality or evolutionary relationship. This observation indicated that the presence of specific resistance genes correlates with the particular Inc group of the plasmids. For example, the resistance genes (aphA1, bla<sub>CMY2</sub>, sul2, cmlA1, floR) were only detected in isolates that carry an IncA/C plasmid, whereas only isolates carrying an IncHI2 plasmid were found to contain the resistance genes aph, sph, tetC, tetD, and ble. Similarly, the aacC gene only appears to be present in those isolates identified as carrying an IncI1 plasmid. The association of different resistance genes with specific Inc groups is well known.

#### Mobilization Plasmids

Plasmids below 8 kb did not carry any antimicrobial resistance or virulence-associated genes. Instead, these smaller plasmids tended to carry genes capable of promoting plasmid mobilization, such as the mbeA, mbeB, mbeC, mbeD genes. S. Heidelberg isolates N189, N653, and N4403, which were originally isolated from chicken breast, carry a small, 3,772 bp plasmid that is identical to the S. Heidelberg SL476 plasmid pSL476\_3 (GenBank accession number: CP001119) (Fricke et al. 2011). All group 3 isolates (fig. 3), except isolate similar Xbal patterns (JF6X01.0032, 24393, have JF6X01.0033, JF6X01.0034, JF6X01.0058), and carry a 4,473 bp plasmid that shares high sequence similarity with the S. Heidelberg plasmid pSH1148\_4.8 (GenBank accession number: JX494965). SARA 35, which was isolated in Brazil, was found to carry a 6,647 bp ColE1 (pCFSAN000443\_01) that is similar to E. coli plasmid ColE1 (GenBank accession number: J01566).

#### **Discussion**

Within the last several years, S. Heidelberg has been identified as one of the top serovars responsible for human illness, including a recent multistate outbreak of an antibiotic-resistant strain associated with consumption of contaminated ground turkey. Using whole-genome sequences, we characterized the genetic diversity of 46 S. Heidelberg isolated over ~30 years. This study illustrates the novel ways in which WGS, combined with phylogenetic analysis, can be used to investigate and characterize the diversity of S. Heidelberg. Using this strategy with outbreak isolates, we were also able to comprehensively characterize and differentiate among highly clonal S. Heidelberg isolates. For example, SNP analysis in combination with phylogenetic analysis is able to determine the phylogenetic relationships among S. Heidelberg isolates, easily separating them from other S. Heidelberg strains, including isolates having the same Xbal and Blnl PFGE patterns and thought to be highly clonal.

**Table 4** Antibiotic Resistance and Plasmid Characteristics of *S.* Heidelberg Isolates Used in This Study

Isolates	Antimicrobial Resistance Profile	MDR Plasmids	Resistance Genes on Plasmids
SARA37	STR, TET	Ind1	aph, sph, strA, strB, tetC, ble
SARA35	AMP	ca 8kb	Ыатемт
SARA32	Susceptible	None	None
SARA31	Susceptible	None	None
N418	AMC,AMP,FOX,AXO,CHL,GEN,KAN,STR,SUL,TET,TIO	IncA/C	aac3-VI, aadA1, aadA2, aadB, aphA1, strA, strB, blacuva blatenn, sul1, sul2, cmlA1,
N19992	Susceptible	None	None
SARA39	SUL	IncHI2	aadA1, sul1, tetG, tetR(G), gacAE
N189	AMC,AMP,FOX,AXO,TIO	Ind1	blacuva sugE2
N1514	Susceptible	None	None
N1536	AMP, GEN,STR,SUL	Ind1	aac3-VI, aadA1, bla <sub>TEW1</sub> , sul1, qac∆E
N4496	Susceptible	None	None
N4403	GEN,STR,SUL	Ind1	aac3-VI, aadA1, sul1, qac∆E
N4541	Susceptible	None	None
N653	GEN,STR,SUL	Ind1	aac3-VI, aadA1, sul1, qac∆E
82-2052	KAN, STR, TET	Incl1	aph, sph, strA, strB, tetC, ble
24390	GEN,STR,SUL	Incl1	aac3-VI, aadA1, sul1, qac∆E
21381	AMC,AMP,FOX,AXO,GEN,KAN,STR,SUL,TET,TIO	Ind1; IncA/C	aac3-VI, aadA1, aphA1, strA, strB, bla <sub>CMY2</sub> , sul1, sul2, tetA, tetR(A), qacAE, sugE2
N4630	GEN,STR,SUL	Ind1	aac3-VI, aadA1,sul1, qac∆E
N19871	AMP,GEN,STR,TET	Ind1	aacC, aadA1, $bla_{TEM}$ , tetA, tetR(A)
N15757	AMP,KAN,STR,TET	Incl1; IncHI2	aph, sph, strA, strB, bla <sub>TEM1</sub> , tetC, tetD, ble
N26457	AMC,AMP,FOX,AXO,GEN,KAN,STR,SUL,TET,TIO	Ind1; IncA/C	aac3-VI, aadA1, aphA1, strA, strB, bla <sub>CMY2</sub> , sul1, sul2, tetA, tetR(A), qac∆E, sugE2
N18393	AMP,GEN,TET	Incl1	aacC, aadA1, blaTEM1, tetA, tetR(A)
N29341	AMP,GEN,STR,TET	Ind1	aacC, aadA1, strA, strB, $bla_{TEM1}$ , tetA, tetR(A)
41578	AMP,GEN,STR,TET	Ind1	aacC, aadA1, blaтыл, tetA, tetR(A)
41563	AMP,GEN,STR,TET	Ind1	aacC, aad $A$ 1, str $A$ , str $B$ , $bla_{TEM1}$ , tet $A$ , tet $R(A)$
41567	AMP,GEN,STR,TET	Ind1	aacC, aad $A1$ , str $A$ , str $B$ , bla $_{TEM1}$ , tet $A$ , tet $R(A)$
41573	AMP,GEN,TET	Incl1	aacC, aad $A1$ , $bla_{TEM1}$ , tetA, tetR(A)
41576	AMP,GEN,STR,TET	Ind1	aacC, aad $A1$ , str $A$ , str $B$ , bla $_{TEM1}$ , tet $A$ , tet $R(A)$
41584	AMP,GEN,STR,TET	Ind1	aacC, aad $A1$ , str $A$ , str $B$ , $bla_{TEM1}$ , tet $A$ , tet $R(A)$
41579	AMP,GEN,TET	Incl1	aacC, aadA1, bla <sub>тем</sub> , tetA, tetR(A)
41566	AMP,GEN,STR,TET	Ind1	aacC, aadA1, strA, strB,bla <sub>TEM1</sub> , tetA, tetR(A)
41565	KAN,STR,TET	IncHI2	aph, sph, strA, strB, tetC, tetD, ble
N30678	AMP,GEN,KAN,STR,SUL,TET	Ind1; IncHI2	aac3-VI, aadA1, aph, sph, strA, strB, bla <sub>TEM1</sub> , sul1, tetC, tetD, ble, qac∆E
32507	KAN,STR,TET	IncHI2	aph, sph, strA, strB, tetC, tetD, ble
24393	KAN,STR,TET	IncHI2	aph, sph, strA, strB, tetC, tetD, ble
N20134	AMP,GEN,STR,SUL	Incl1	aac3-VI, aadA1, sul1, qac∆E
29169	Susceptible	None	None
24391	KAN,STR,SUL	Incl1	aac3-VI, aadA1, sul1, qac∆E
24359	GEN,KAN,STR,SUL,TET	Incl1; IncHI2	aac3-VI, aadA1, aph, sph, strA, strB, sul1, tetC, tetD, ble, qac∆E
24388	Susceptible	None	None
20752	KAN,STR,TET	IncHI2	aph, sph, strA, strB, tetC, tetD, ble
N18413	AMP,GEN,TET	Incl1	aacC, aadA1, bla <sub>TEM1</sub> , tet4, tetR(A)
N18440	AMP,GEN,STR,TET	Ind1	aacC, aadA1, bla <sub>TEM1</sub> , tetA, tetR(A)
N19/152	AMP.GEN.STR.TET	Ind1	aacC, aadA1, blaπevii, tetA, tetR(A)



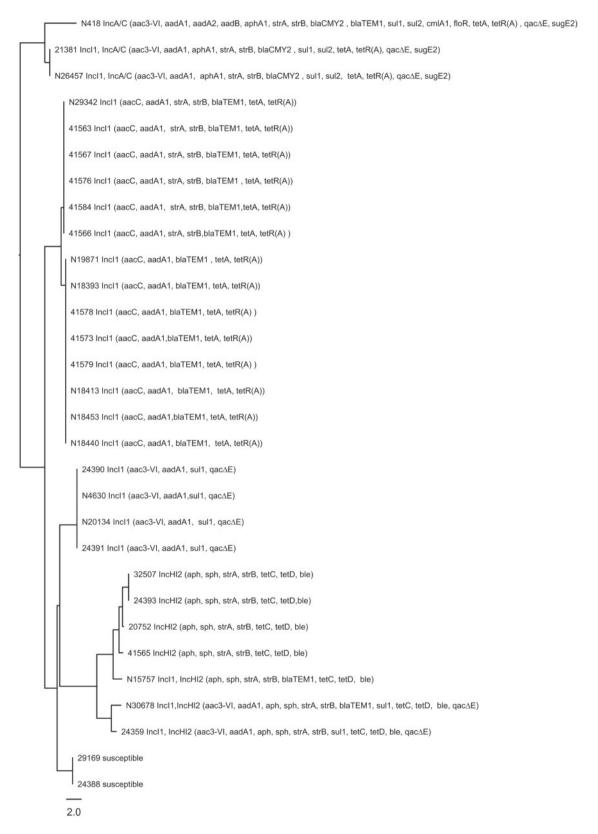


Fig. 8.—Absence and presence tree of resistance genes among *S*. Heidelberg isolates associated with paraphyletic group 3. It is a similarity tree based on binary distances under neighbor-joining algorithm for tree construction. The resistance genes and incompatibility group of the resistance plasmid are mapped to the tree.

We also found that the SNP analysis clustered isolates together that did not have the same PFGE profiles, such as the 2011 outbreak isolates, which were distinct on the PFGE two-enzyme dendrogram. SNP analysis tightly clustered the clinical and ground turkey outbreak isolates together and distinguished these from other apparently clonal isolates that shared the same PFGE and antibiotic resistance profiles. This result confirms the epidemiological data that the clinical and ground turkey isolates belong to the same outbreak, and are separate from other strains grouped with them by PFGE.

We found two nonsynonymous SNPs that were present only among the outbreak isolates. The first of these SNPs was found to be located on the gluconate transporter *gntP* gene. The biological role of GntP might be to permit the host to take up gluconate when only tiny amounts are present, thereby conferring an advantage to the host in a competitive environment (Klemm et al. 1996). The second of these SNPs was located within a gene encoding a putative hydrolase (phosphoserine phosphatase). This gene is involved in glycine and serine metabolism, and resulted in a proline to glutamine amino acid change that is known to change the secondary structure of this enzyme.

SNP-based phylogeny clearly has a distinct advantage in subtyping clonal isolates because the method offers nucleotide base resolution. We detected 4,053 SNPs within highly clonal S. Heidelberg isolates. Compared with the PFGE analyses that grouped isolates together having the same Xbal and BINI patterns, the resolution of the SNP phylogeny conclusively demonstrated that genome sequencing distinguishes between outbreak and nonoutbreak isolates that shared the same Xbal and Blnl patterns. The results from the ML tree generated from the SNP matrix constructed with kSNP are concordant with those observed based on the SNP matrix developed with our custom pipeline. The study showed that SNP analysis is very consistent and reliable, confirming that even when different methods were used to identify SNPs, there are no appreciable changes in the overall phylogeny of the strains included in the analyses.

Only a few mutation "hotspot" genes were found to have a disproportional number of SNPs and that might serve as targets useful for rapidly subtyping serovar Heidelberg. Although these genes have several SNPs, the haplotype diversity is fairly low, indicating there are only few unique sequences among *S*. Heidelberg. This information supports the value of SNP analysis as a useful tool for subtyping this serovar.

WGS data and comparative genomics not only offer a useful subtyping method to differentiate closely related bacteria, but they also provide a better understanding of pathogenicity and evolution. Our results show substantial loss and gain of plasmids and phages between these *S*. Heidelberg isolates that were consistent with previously generated tree topologies. The phages found among these strains are known

to carry cassette genes (morons) encoding factors that enhance the proliferation and dissemination of the prophage by improving the fitness and /or virulence of the lysogen (Boyd and Brussow 2002; Pelludat et al. 2003). This possibility has led to the assumption that phage-mediated distribution of virulence factors and fitness factors is a key driving force in the optimization of Salmonella-host interactions and the emergence of new epidemic clones (Brussow et al. 2004). For example, lambda-like phage Gifsy-2, which is present among all S. Heidelberg isolates examined in the study, carries the virulence factor periplasmic CuZn-superoxide dismutase (SodCI), an enzyme that has the potential to enhance the fitness of a Gifsy-2 lysogen (Brussow et al. 2004). Moreover, the prophage P4 and prophage P2-like were associated with isolates from group 3 which included the outbreak isolates. The P2like phage carries the sopE1 gene that encodes part of the T3SS that translocates bacterial effector proteins directly into the cytosol of host cells. The phage P2-like has also been identified in S. Typhimurium strain DT49/DT204 that caused a major outbreaks in Europe in 1970s and 1980s. It has been speculated that lysogenic conversion with sopE1 was an important step in the emergence of this epidemic strain (Mirold et al. 2001). Interestingly, Mirold et al. reported that sopE1 is not restricted to a certain bacteriophage as a "vehicle," identifying sopE1 in other serovars present on a Gifsy-like phage (Mirold et al. 2001). We also saw the same phenomenon among the S. Heidelberg of this study where the sopE1 gene, which was found to be present among all isolates, was carried by both the P2-like and the lambda-like Gifsy-2 phages.

The exchanges of genetic cassettes between unrelated phages further increase the degree of HGT noted among *S*. Heidelberg strains, clearly demonstrating the importance of phages in the emergence and evolution of *Salmonella* pathogens. To date, this is the first time that phages have been characterized by name among *S*. Heidelberg isolates and that a P2-like phage was identified in *S*. Heidelberg that carries the *sopE1* gene. This phage and, subsequently, the *sopE1* determinant, was present in the outbreak isolates, possibly serving as one of the virulence factors giving rise to these pathogens. Furthermore, we identified the presence of 74 virulence determinants in all *S*. Heidelberg isolates.

In the course of performing this study, both newly sequenced plasmids and plasmids sharing a high sequence similarity to previously described plasmids (Han et al. 2012) were identified. Similar to the phage presence and absence tree topology previously described, the mobilization plasmids absence/presence seemed to correlate with the tree topology according to the plasmid(s) they carried. For instance, the 3,772 bp mobilization plasmid was only identified in isolates belonging to paraphyletic group 2, whereas the 4,473 bp plasmid was found only in isolates which belong to the paraphyletic group 3 on the ML tree. The mobilization plasmids carry the genes necessary to encode the proteins involved with



relaxosome formation and processing. Moreover, these plasmids are efficiently transferred by other plasmids, such as Incl1 and IncX (Francia et al. 2004), two plasmids frequently found among the S. Heidelberg in this and other studies (Folster et al. 2012; Han et al. 2012). The mobilization plasmids tend to be retained and are, continually carried by specific groups of S. Heidelberg isolates, suggesting that they must play an essential role in this serovar survival, although the precise role is unclear. Plasmid sequence analysis detected additional plasmids that encode several S. Heidelberg virulence determinants, including T4SS and antibiotic resistance genes. Unlike the smaller plasmids, the loss and gain of the larger plasmids (ranging from 33 to >200 kb) did not correlate with the tree topology. The plasmid analyses performed in this and previous studies (Folster et al. 2012; Han et al. 2012) demonstrated that S. Heidelberg isolates have at least four transmissible plasmids, including an IncA/C, Incl, and IncHI2 and IncX plasmid. The IncA/C, Incl, and IncHI2 plasmids carry genes that are important for virulence, colonization, and persistence, as well as those encoding resistance determinants to heavy metals, disinfection, and antimicrobial agents. We determined that most of the antimicrobial-resistance phenotypes could be accounted for by resistance genes carried on plasmids. We did not identify an instance of resistance occurring in the absence of a corresponding gene. This shows that genetic prediction of phenotypic resistance may be possible and may become necessary as clinical diagnostics moves toward cultureindependent technologies. More studies are necessary to determine how well specific DNA sequences, and combinations of sequences, predict resistance or susceptibility to various antimicrobial agents.

Besides the Incl1 and the IncHI2 antibiotic resistance plasmids, an IncX plasmid that encodes the structural components of the VirB/D4 T4SS apparatus was detected in most of the outbreak isolates. The VirB/D4 T4SS apparatus is important in that it assists with "rapid dissemination of antibiotic resistance and virulence determinants" (Bhatty et al. 2013). Unlike other secretion systems, the T4SS is not only capable of acting in a conjugative fashion disseminating DNA to other bacteria, thereby contributing to genome plasticity and the evolution of infectious pathogens through dissemination of antibiotic resistance and virulence genes, but also capable of transferring protein effectors across both the bacterial and eukaryotic plasma membrane directly into the cytosol of the target cells, thereby contributing directly to bacterial pathogenicity (Juhas et al. 2008; Gokulan et al. 2013). The T4SS was first described for Agrobacterium tumefaciens and consists of 11 proteins encoded by the virB gene complex. Of particular interest was the fact that some plasmids carrying the T4SS, such as those of the IncX group, also carry systems that confer plasmid stability among the strains possessing the plasmid. For instance, the IncX plasmids carry the toxin-antitoxin system genes (hicA), (hicB), as well as the toxin/antitoxin stability genes (stbE), (stbD), both of which contribute to the plasmid stability to assure that the plasmid as well as its associated virulence determinants are inherited by all bacterial progeny (Yamaguchi and Inouye 2011; Unterholzner et al. 2013). As such, these genes serve to stabilize the "pathogenic potential" of these isolates.

Finding that the T4SS system was present in the majority of the pathogenic isolates and carried on plasmids also bearing determinants associated with assuring vertical transmission of the plasmid to progeny bacteria, we sought to assess the role of the T4SS in overall pathogenicity. Using the *C. elegans* virulence assay, we confirmed that *S.* Heidelberg isolates that carried components of the T4SS were more pathogenic in this model than isolates that did not carry the system, suggesting the T4SS plays a role in the pathogenicity of *S.* Heidelberg. Much more inclusive investigations must be performed to fully understand the role of plasmid-encoded genes in pathogenesis, with special emphasis on the role of virulence-associated VirB/D4 T4SS secretory mechanism.

In summary, the data presented in this study support the role of transmissible mobile genetic elements in the evolution of virulence and resistance among *S*. Heidelberg. Understanding the results and the role of these elements is very important since *S*. Heidelberg is the second most common serovar, following *S*. Typhimurium, responsible for *Salmonella*-related deaths in the United States (Kennedy et al. 2004; Patchanee et al. 2008). Although the mechanisms responsible for *S*. Typhimurium pathogenicity and colonization are well studied, fewer studies are available for *S*. Heidelberg (Han et al. 2011). Presumably, the transmissible plasmids identified in our strain set play a major role in the spread of virulence and resistance genes among *S*. Heidelberg and, most likely, other *Salmonella* serovars.

The results from this and other studies suggest that plasmids are being exchanged quickly. For example, it was noted that some strains associated with the 2011 outbreak isolated from the same state had different plasmid profiles. In addition to the ecological benefits conferred as a consequence of this rapid plasmid exchange, large plasmids can change PFGE patterns. We noted that, while most of the sequenced isolates associated with the 2011 outbreak had *BlnI* PFGE pattern JF6A26.0076, a single isolate, 41565, had a different, JF6A26.0017 *BlnI* pattern, most likely due to the presence of an IncHI2 plasmid rather than IncI1. Other closely related isolates not associated with the outbreak carrying the IncHI2 plasmid also exhibited *BlnI* PFGE pattern JF6A26.0017.

The results determined in this study have convincingly shown that WGS analysis could be a useful tool for identifying the source of contamination and studying the short-term evolution of these epidemic clones. In the context of the 2011 ground turkey-associated outbreak, SNP analysis provided an excellent tool for subtyping *S*. Heidelberg and clustering closely related isolates together. Using these data, we determined that the antibiotic-resistant outbreak isolates diverged

from environmental isolates through the gain of several virulence factors, such as *sopE1* gene carried on Phage P2 or the T4SS system carried on the IncX plasmid. Of particular interest, other isolates in paraphyletic group 3 on the ML tree carried the same virulence factors as the 2011 outbreak strain, suggesting that this strain has been seen earlier in the environment and that the outbreak occurred as a consequence of changes in outside influences such as the dose or the handling of the food.

CDC projected that for every case of Salmonella reported that 29.3 cases occur in the community and 28.3 cases goes undiagnosed or unreported (Scallan et al. 2011), suggesting that the 2011 outbreak actually may have sickened over 4,000 people in the United States. The World Health Organization has declared that most countries have documented a significant increase of microorganism-mediated foodborne illnesses (WHO 2013). Therefore, it is paramount to have a robust identification system that can distinguish closely related strains in an outbreak situation. To date, DNA "fingerprinting" facilitated by PFGE at PulseNet has often been used to establish the source of clinical isolates. However, several examples in the past have shown that PFGE may not be as useful for some serotypes that show less diversity by PFGE (CDC 2010a, 2010b). Therefore, it is essential to develop and evaluate other methods for their ability to effectively and accurately discriminate outbreak isolates from nonoutbreak isolates, like the combination of WGS and computationally efficient methods of analysis. Such a combination of approaches also will help to genetically link the implicated food sources of contamination with farm or factories. As more WGS data are gathered and analytical tools developed in combination with epidemiology investigations, we anticipate significant improvements in timeliness of outbreak investigations and attribution of human infections to specific sources.

# **Supplementary Material**

Supplementary tables S1 and S2 and figures S1–S4 are available at *Genome Biology and Evolution* online (http://www.gbe.oxfordjournals.org/).

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